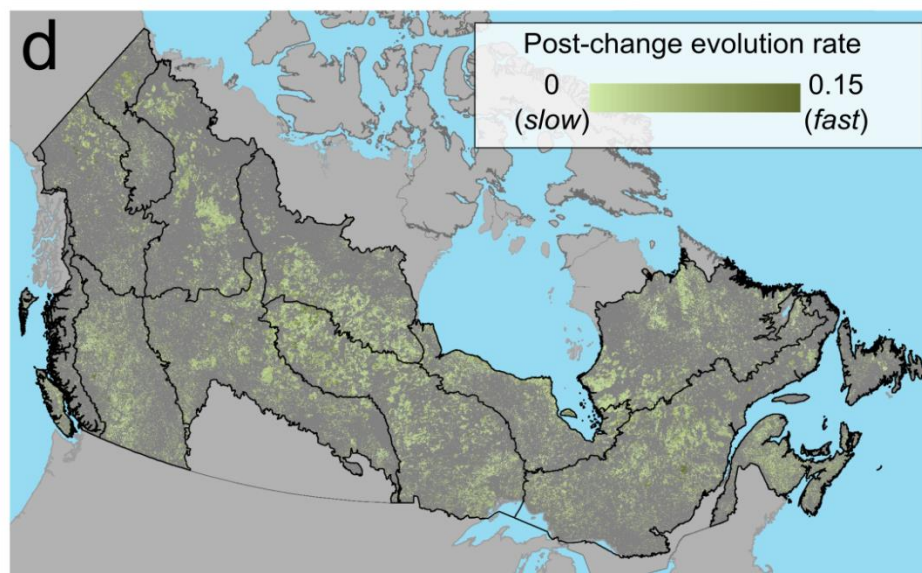
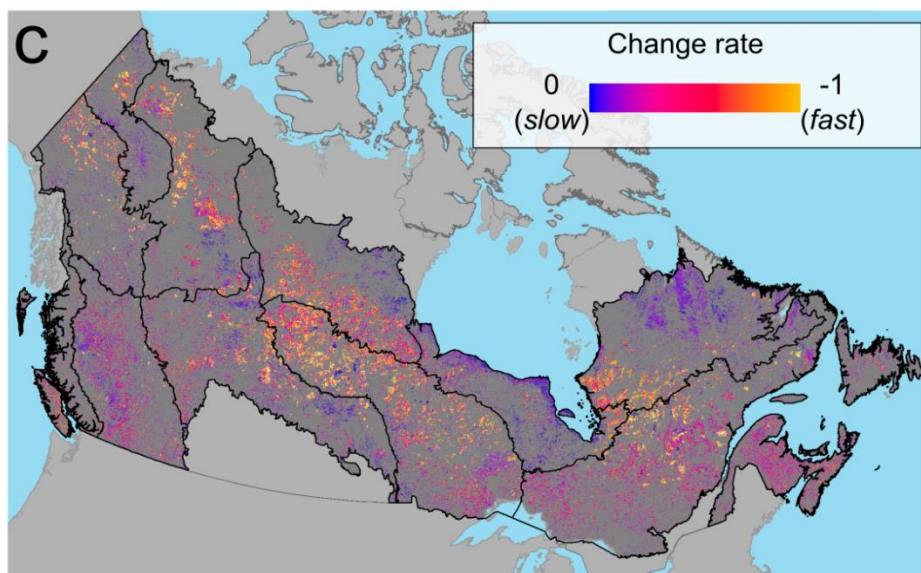
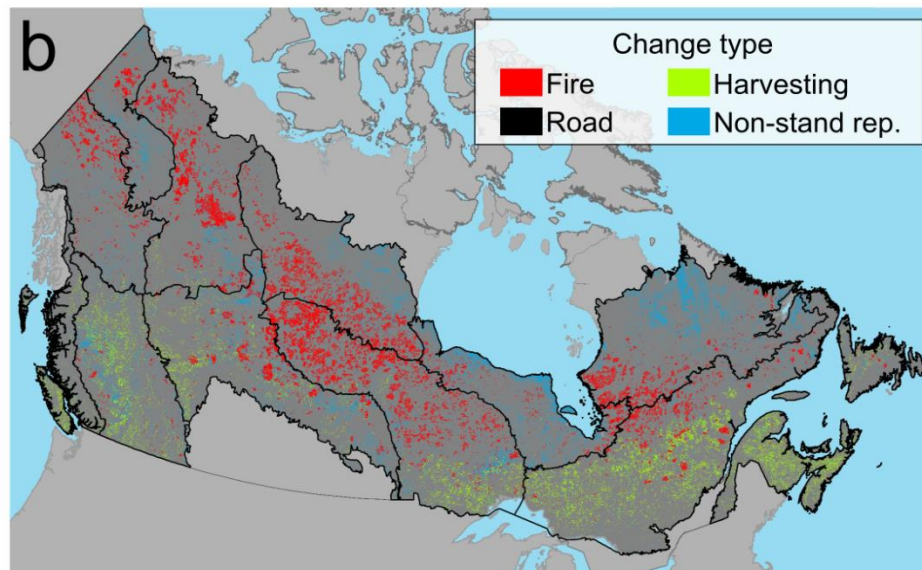
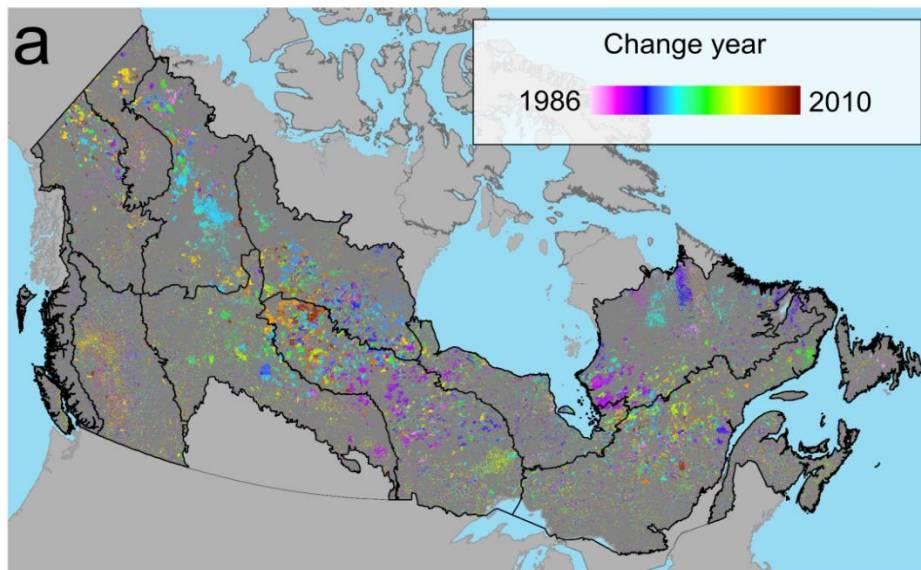


# Remotely sensed change product considerations

M. Wulder, J. White – CFS,  
N. Coops, T. Hermosilla, D. Bolton – UBC  
R Kennedy, W. Cohen – OSU  
T. Schroeder - USGS

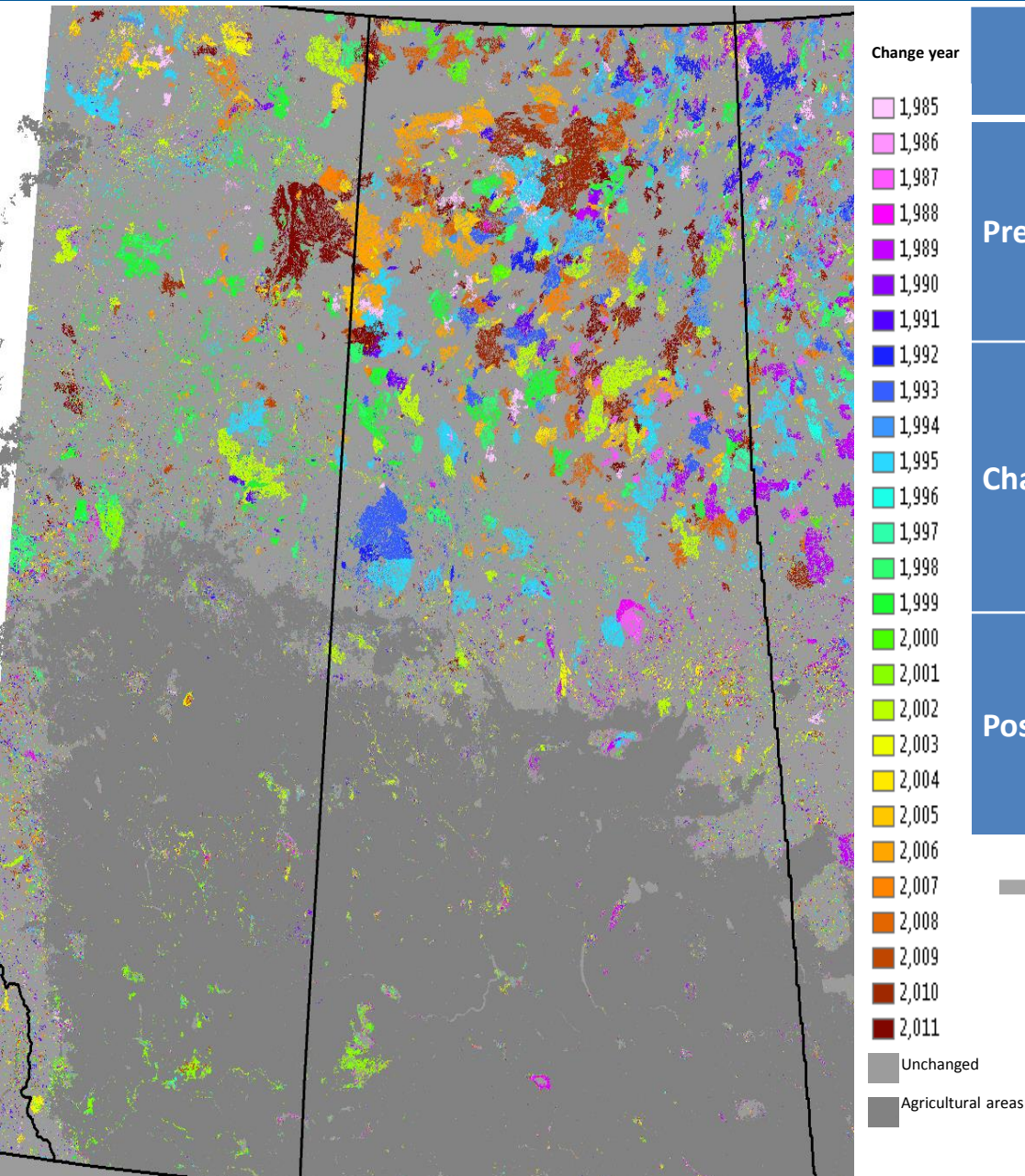
# Outline

- Nature of change from time series
- Hierarchy of change
  - Change / no-change though to labeled change
  - What is labeled, what is left
- Subtle change, depletions
- Time series change products (pre, during, post)
- Forest recovery (what is related, sensitivity of RS indices)

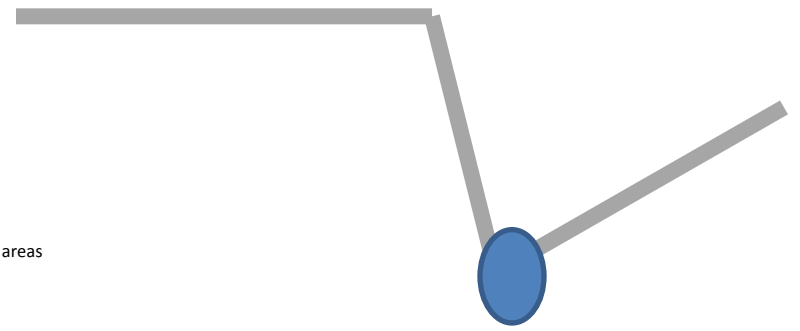




# Change detection outputs

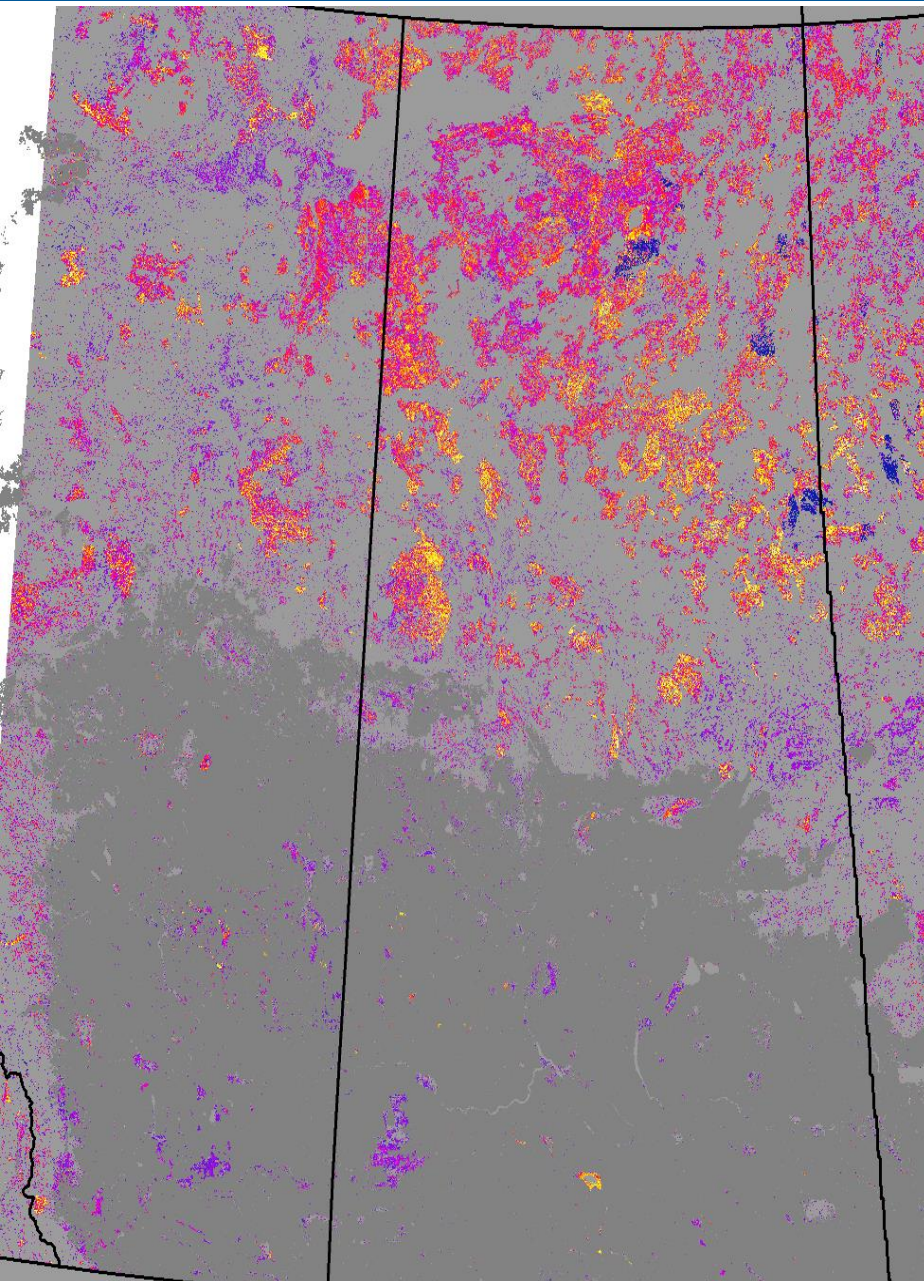


	Metric
Pre-change	Pre-change magnitude variation
	Pre-change persistence
	Pre-change evolution rate
Change	Change year
	Change persistence
	Change magnitude variation
	Change rate
Post-change	Post-change magnitude variation
	Post-change persistence
	Post-change evolution rate





# Change detection outputs

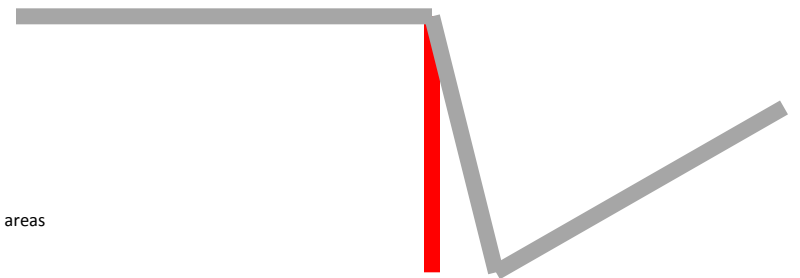


Change magnitude  
variation

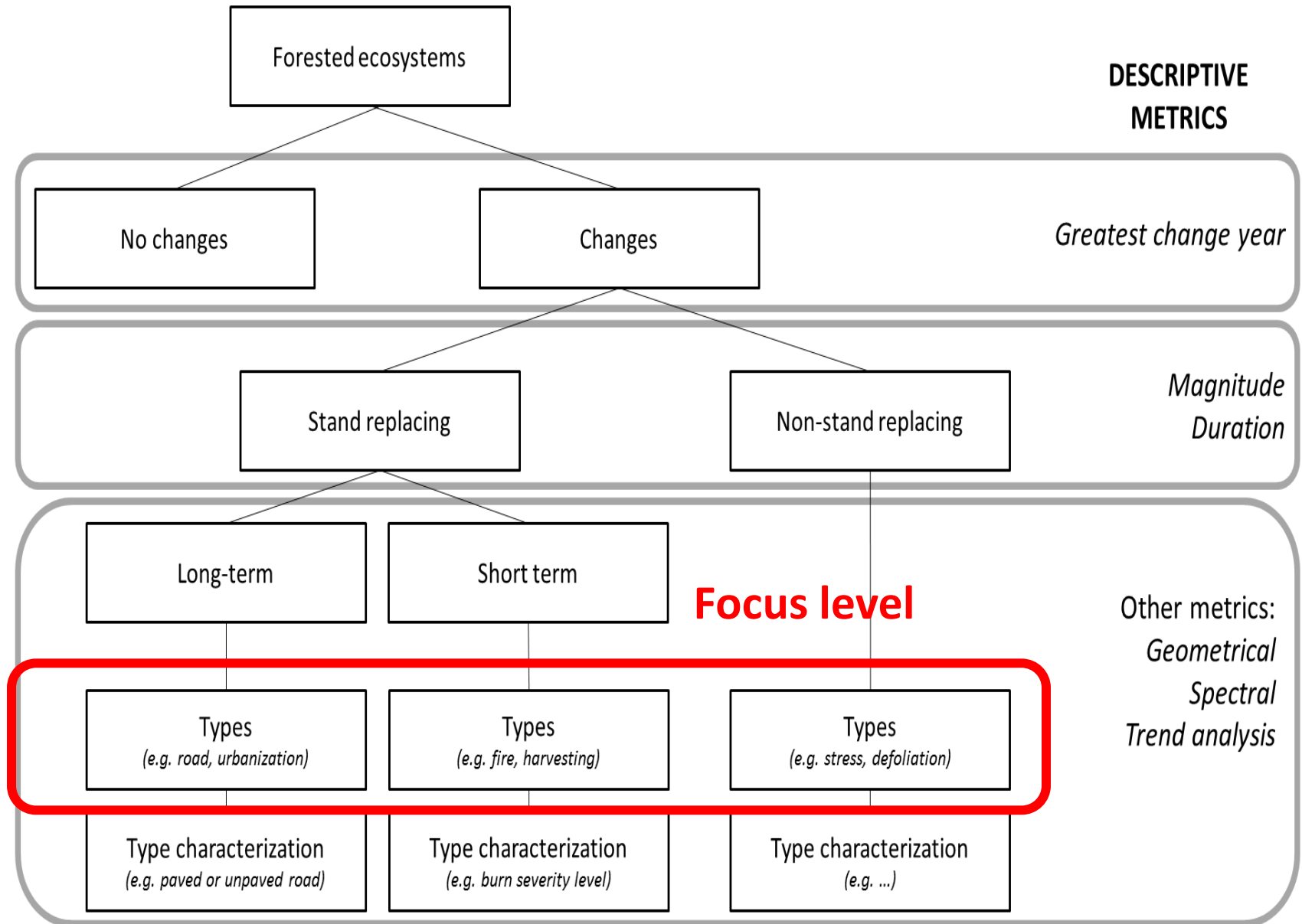


Unchanged  
Agricultural areas

	Metric
Pre-change	Pre-change magnitude variation
	Pre-change persistence
	Pre-change evolution rate
Change	Change year
	Change persistence
	Change magnitude variation
	Change rate
Post-change	Post-change magnitude variation
	Post-change persistence
	Post-change evolution rate

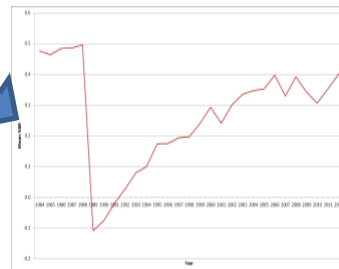
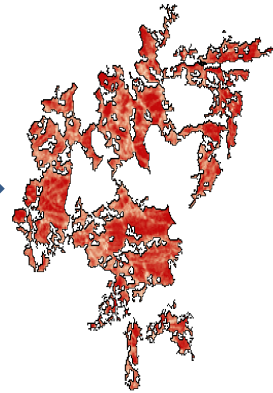
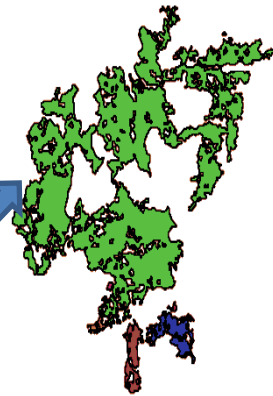
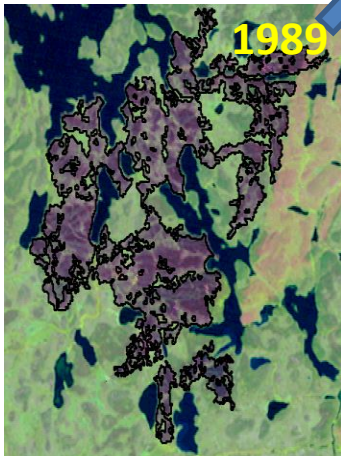
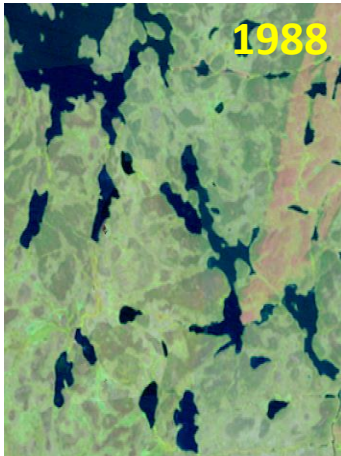


# Hierarchy of change



# Change attribution

## Descriptive Metrics



### Geometry

- Area
- Perimeter
- Compactness
- Shape index
- Fractal dimension

### Spectral

- Average spectral value pre-change b4, b5, b7, NBR
- Average spectral value post-change b4, b5, b7, NBR
- Standard deviation value post-change b4, b5, b7, NBR
- Average pixel series value b4, b5, b7, NBR
- Standard deviation of pixel series values b4, b5, b7, NBR
- Range of pixel series values b4, b5, b7, NBR

### Trend analysis

- Duration
- Average change magnitude variation NBR
- Pre-change magnitude variation NBR
- Pre-change duration
- Pre-change evolution rate NBR
- Post-change magnitude variation NBR
- Post-change duration
- Post-change evolution rate NBR

## Random Forest

### Categories:

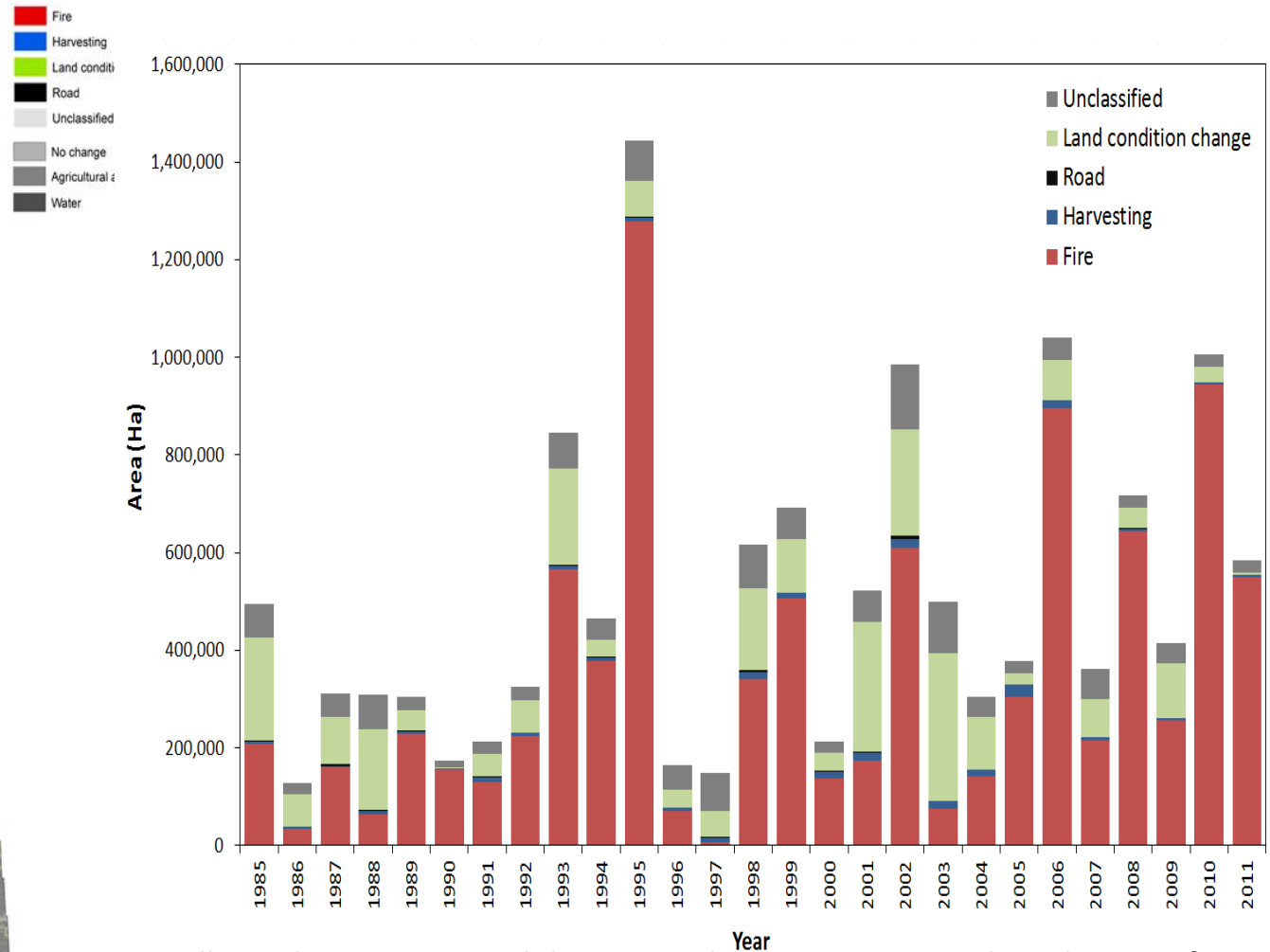
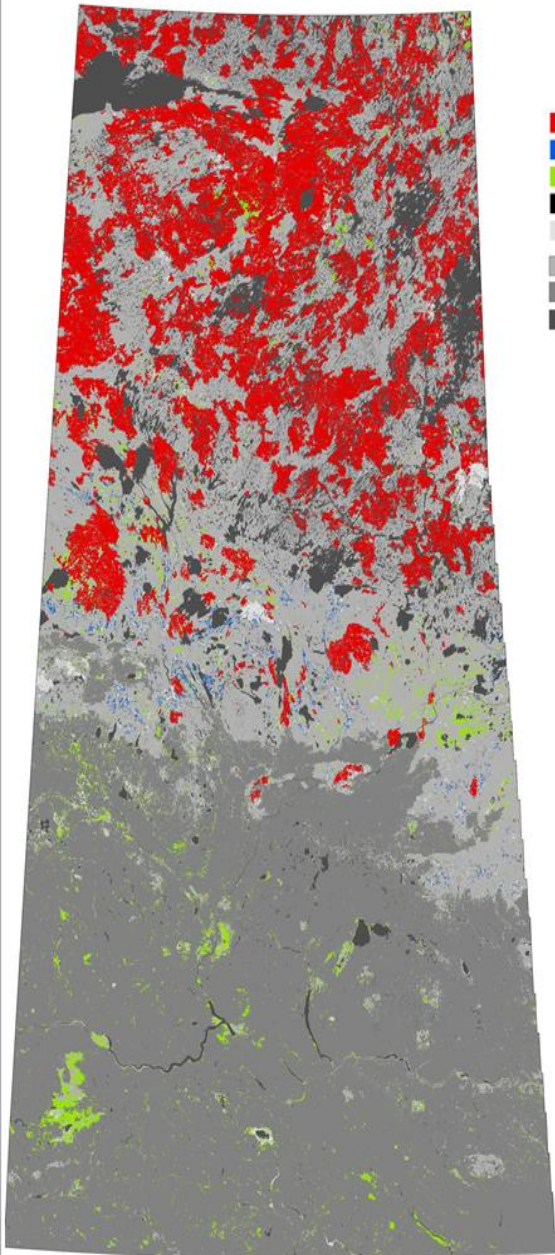
*Fire*  
*Harvesting*  
*Road*  
*Land condition change*

### Low confidence attributions:

*Unclassified*



# Change attribution results (SK)



Hermosilla et al. 2015. Regional detection, characterization, and attribution of annual forest change from 1984 to 2012 using Landsat-derived time-series metrics. RSE. 170: 121–132.



# Change product considerations

- Non-stand replacing, or forest related, change
- Algorithms robust in different environments, change agents, ecological conditions, etc.
- Subtle positive change, growth, increasing in canopy cover
- Subtle negative change, stress, defoliation

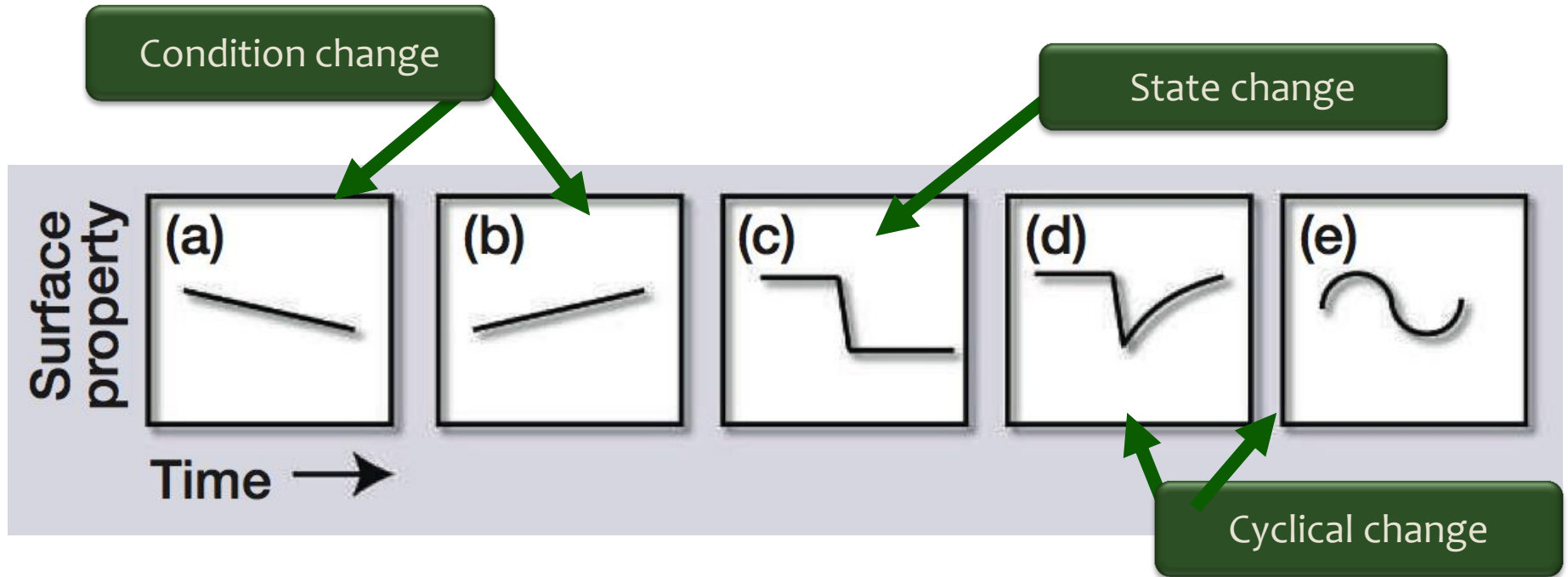
Kennedy et al. 2014. Bringing an ecological view of change ... FEE. 12: 339–346.

Gómez et al. 2011 Characterizing the state and processes of change... RSE. 115(7):1665-1679

Cohen et al. 2015. Forest disturbance ... decline... FEM. 360:242-252

# Handling other types of change

- Change occurs *all the time*



- Temporal grain and extent matter – for product timing and for definitions of products

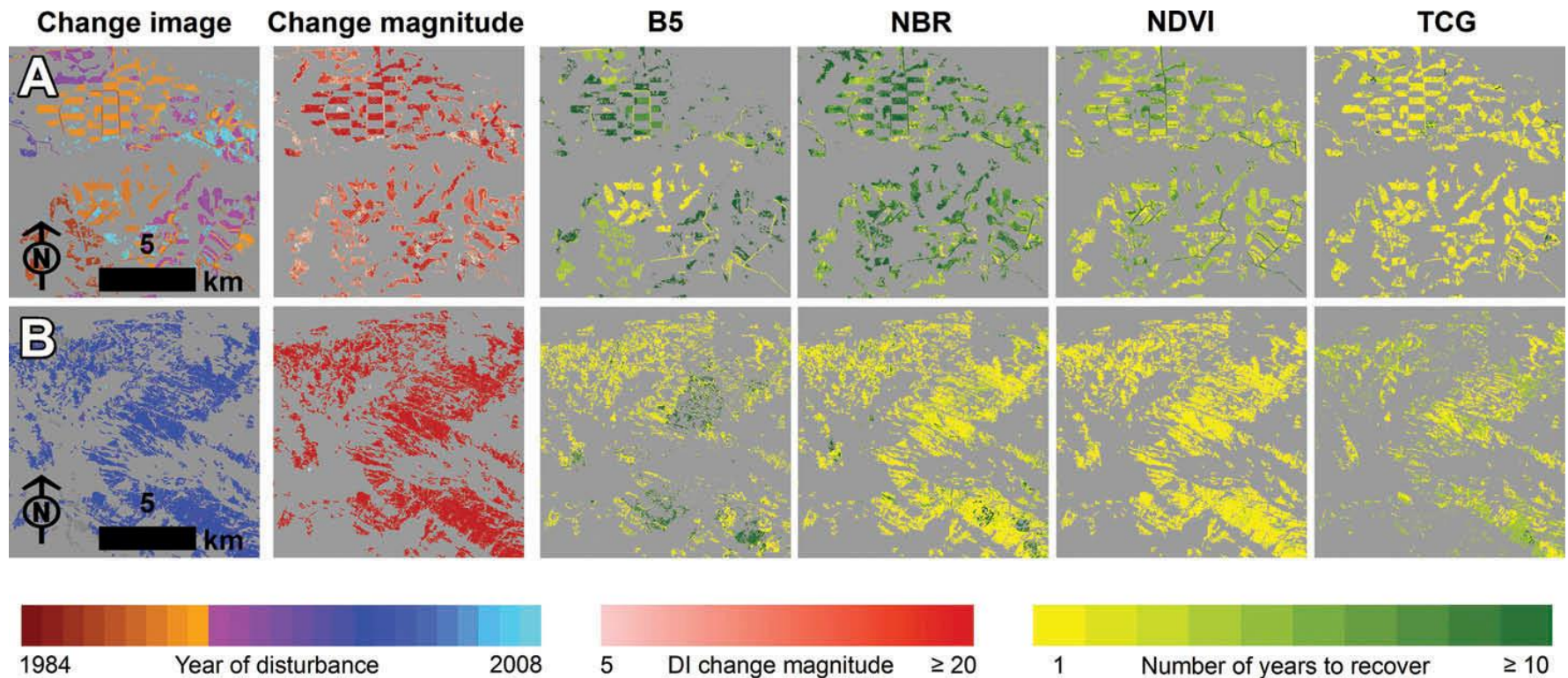
# Aims / considerations for products...

- Require quality assurance (to what level?)
- Require ATBD
- Want to avoid a proliferation of products
- Satisfy a range of users
  - Forest, ag, urban, high latitude ecosystems, etc.
  - Impact on products, algorithms
- How far to go with products?
- Analysis enabling vs outcome products
- Products and tools



# “Recovery”

- Perspectives:
  - Ecological, silvicultural, spectral
  - Spectral recovery varies by method & index or band



# Thank you!

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@mikewulder



Canada

## Publications:

[https://www.researchgate.net/profile/Michael\\_Wulder](https://www.researchgate.net/profile/Michael_Wulder)

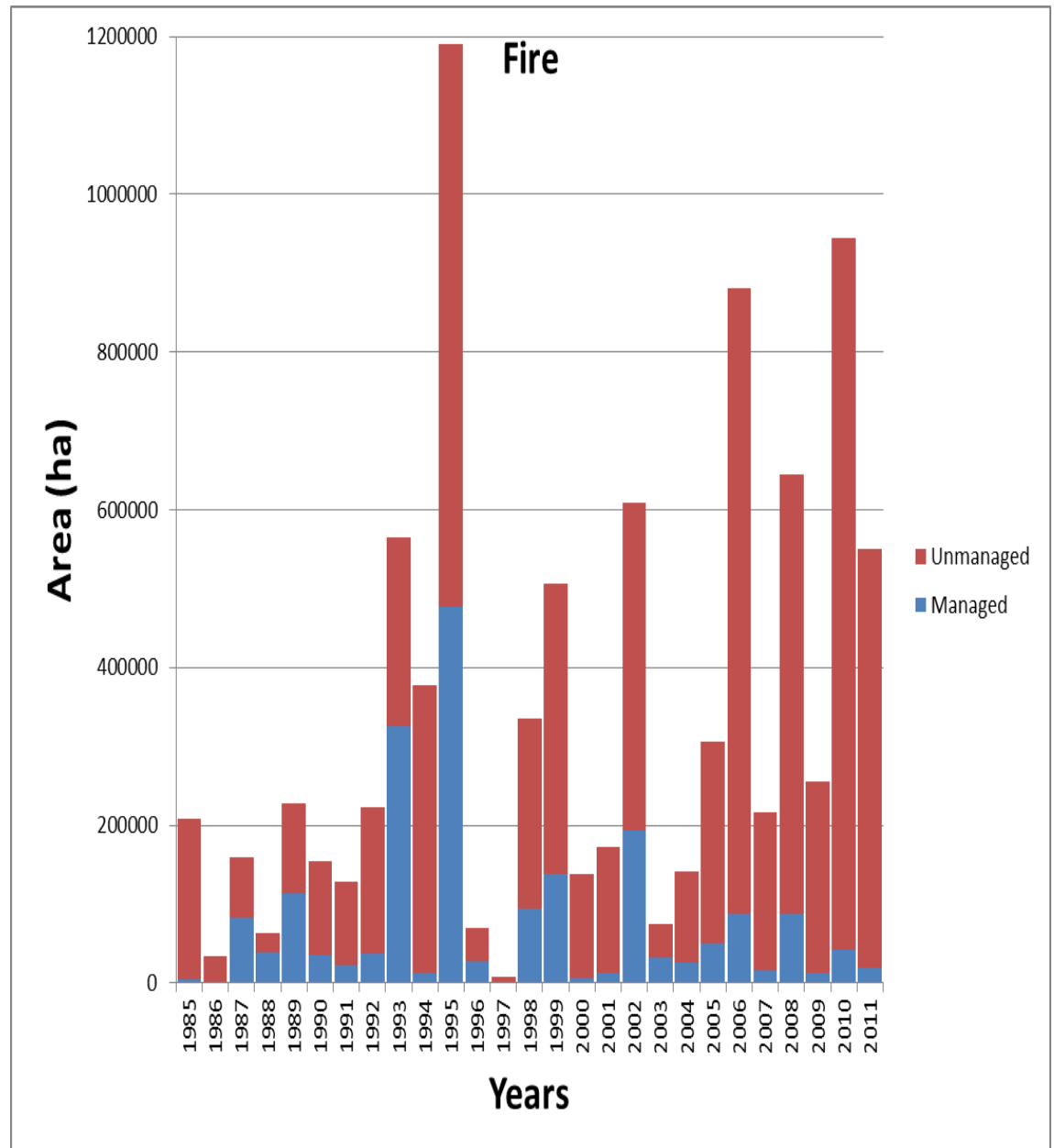
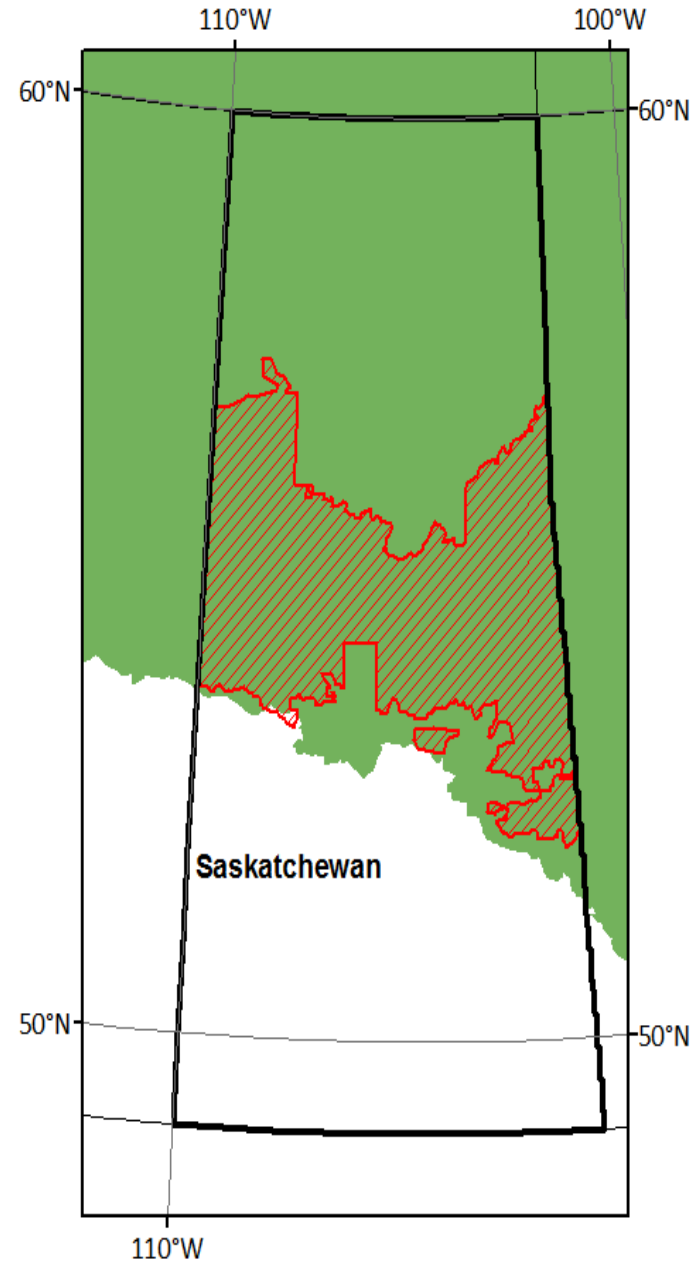


Natural Resources  
Canada

Ressources naturelles  
Canada

This research was undertaken as part of the “***National Terrestrial Ecosystem Monitoring System (NTEMS): Timely and detailed national cross-sector monitoring for Canada***” project jointly funded by the Canadian Space Agency (CSA) Government Related Initiatives Program (GRIP) and the Canadian Forest Service (CFS) of Natural Resources Canada.

# Change attribution results (SK)





# Change attribution results (SK)

